

Exploring High-Dimensional Data in Astronomy, Genomics, and beyond, using glue

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& President, glue solutions, inc.

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Chief Technology Officer, glue solutions, inc.



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MOORE
FOUNDATION



glue
solutions
inc.



What is glue?

multidimensional data exploration

It's not an acronym.

It is open-source software that
glues data,
glues graphs &
glues tools.

data



numbers (tables, arrays, spreadsheets)

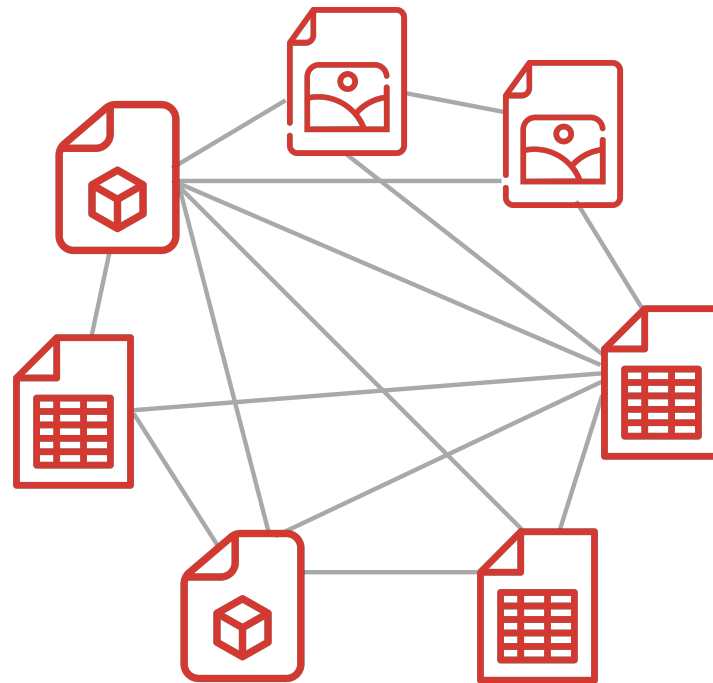


images & maps (FITS, JPEG, GIS and more)



data cubes (3D, 4D, and more)

data files' common attributes are **glued**



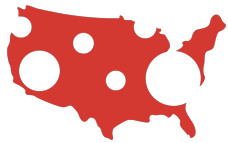
avoiding the need to merge data files

“graphs”



common statistical graphics

(scatterplots, histograms, tables, curves, overlays)



maps & images

(greyscale, color, contours, layer control...)



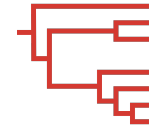
3D displays

(scatter plots, volumetric rendering, sliders...)



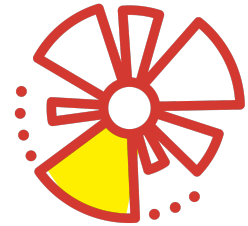
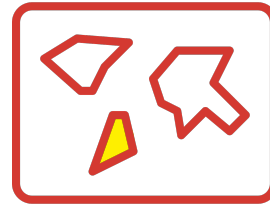
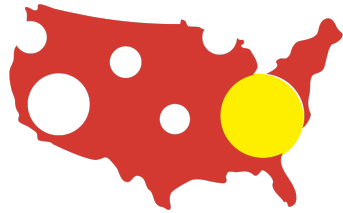
specialized & custom charts

(dendrograms, polar plots, + domain-specific options)





selections propagate across all **graphs**

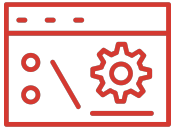


for real-time data exploration & insight

tools



plug-ins (user-defined formats, plots, layouts...)



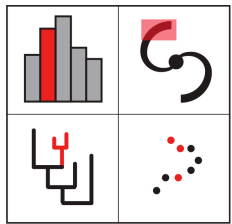
web services (across domains)



command-line (built-in terminal, scriptable)



for easy customization



glue
multidimensional data exploration

glues data,
glues graphs &
glues tools.

glueviz.org

BONUS: **save, share, or publish** what you learn—

save “sessions” to continue where you left off

export graphics

use/export to Jupyter environments

export to plot.ly (javascript)

export to augmented reality

learn how at glueviz.org.



glueviz.org

supported by



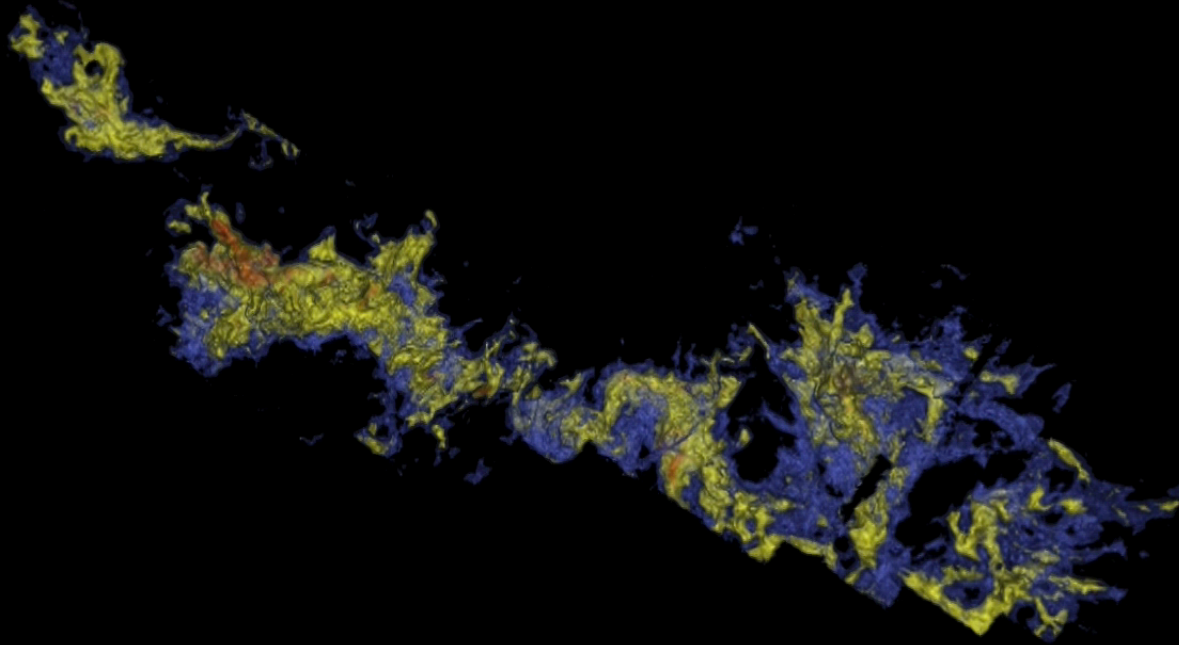
glue
solutions
inc.

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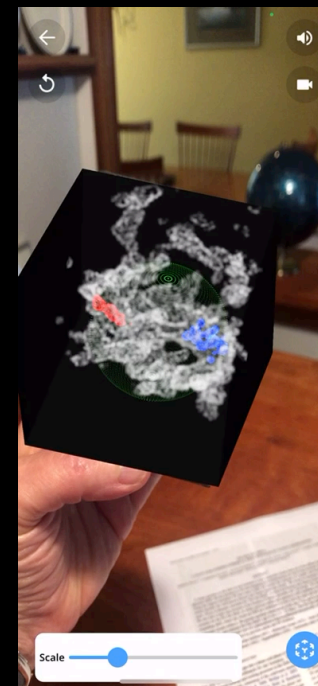
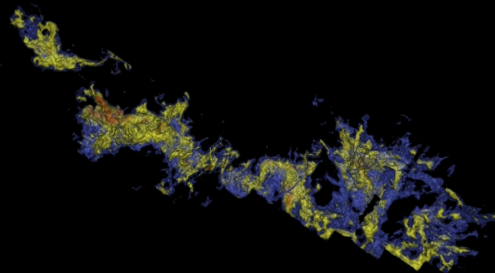
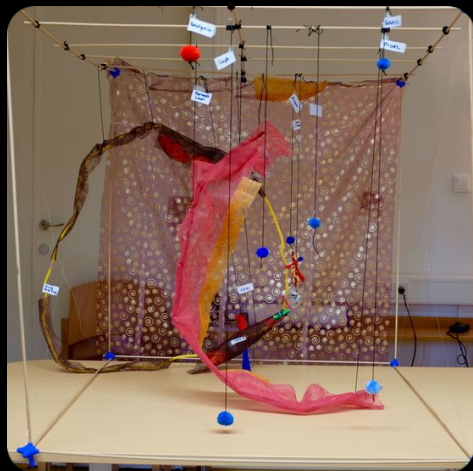
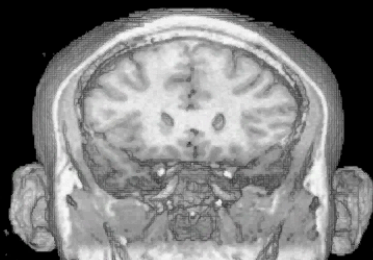
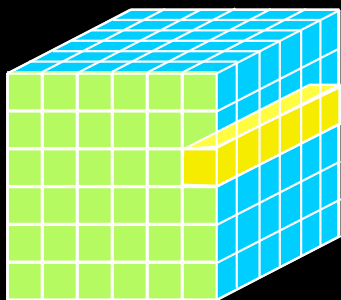
Exploring High-Dimensional Data in Astronomy, Genomics, and beyond, using glue








NICK HOLLIMAN'S PERSEUS, C. 2007 (VOLVIEW)

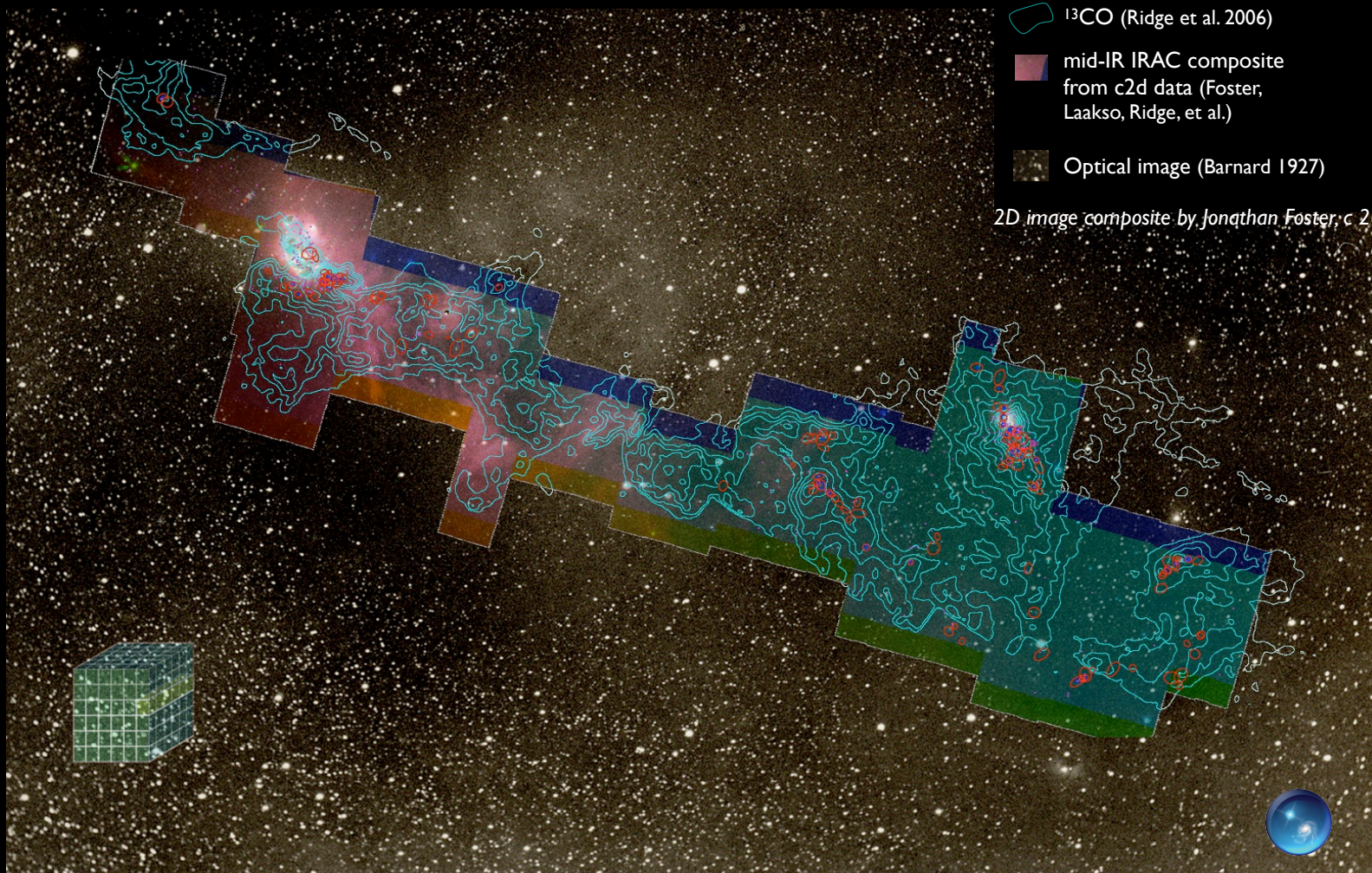


"DATA, DIMENSIONS, DISPLAY"

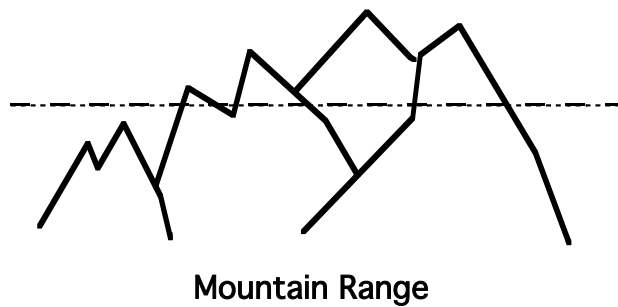
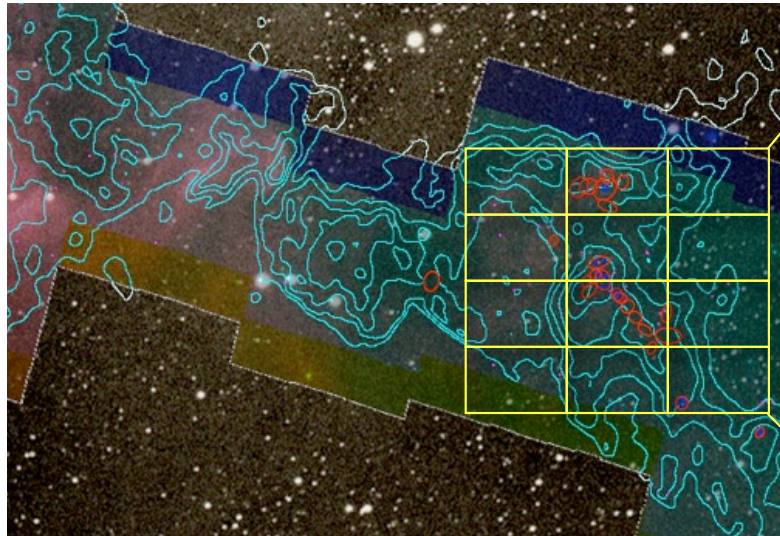
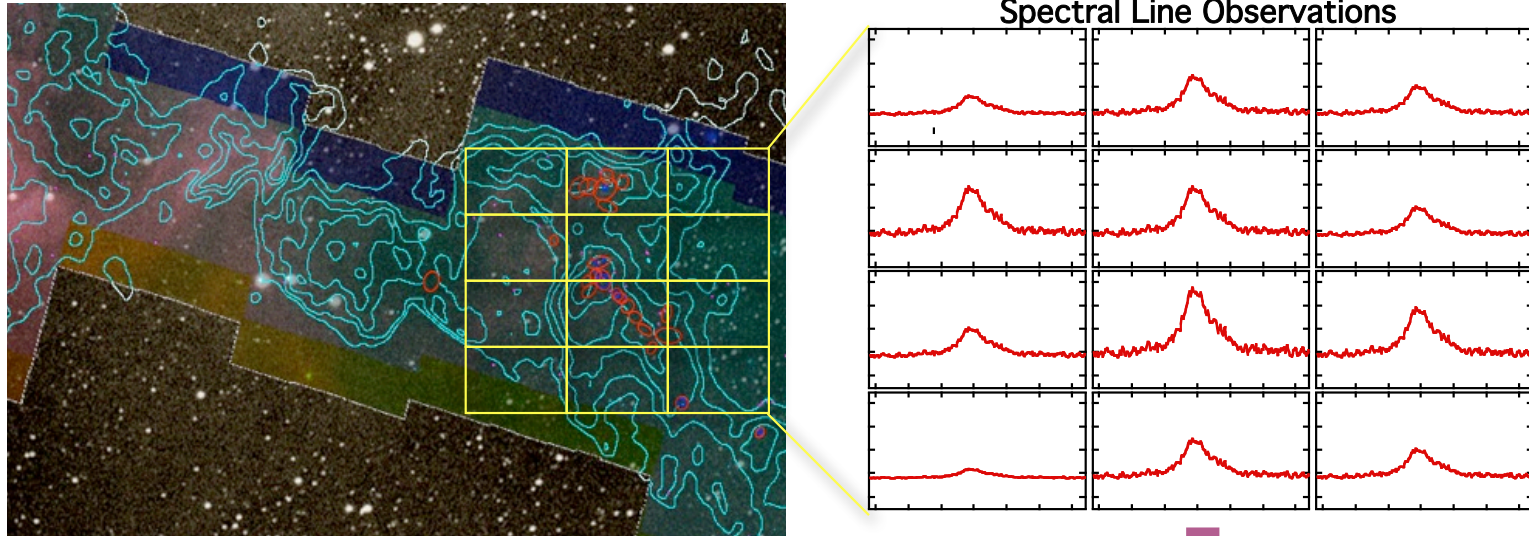


-  mm peak (Enoch et al. 2006)
-  sub-mm peak (Hatchell et al. 2005, Kirk et al. 2006)
-  ^{13}CO (Ridge et al. 2006)
-  mid-IR IRAC composite from c2d data (Foster, Laakso, Ridge, et al.)
-  Optical image (Barnard 1927)

2D image composite by Jonathan Foster, c 2006



Spectral-line mapping (what's "p-p-v" space?)



No loss of information

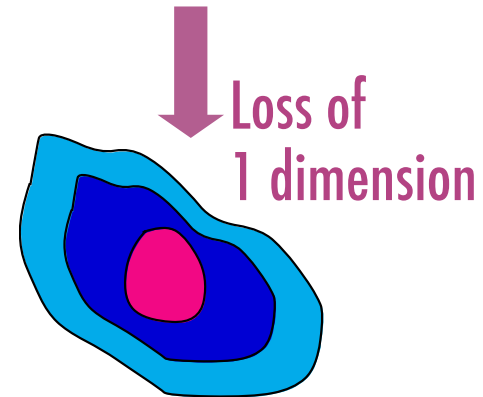
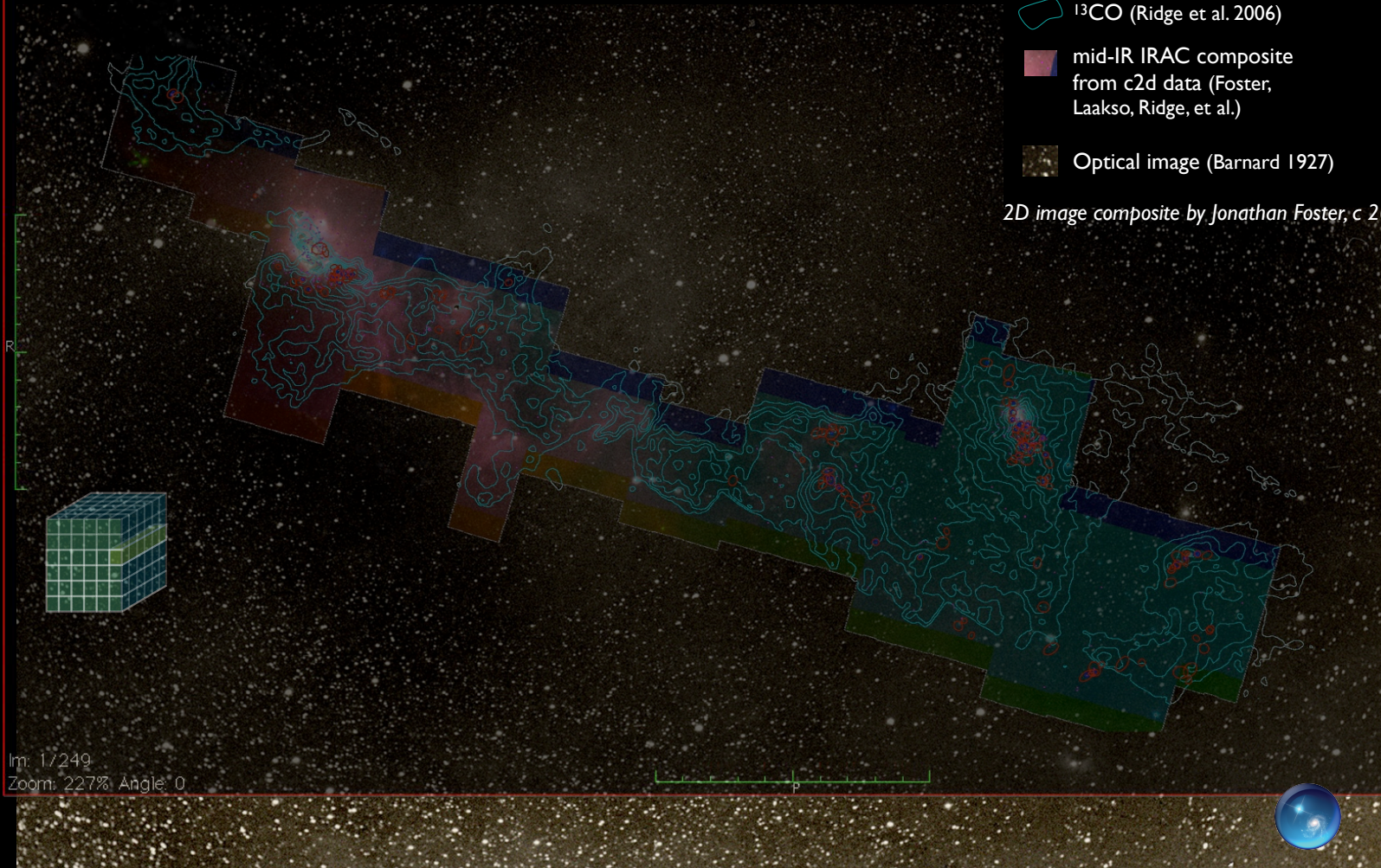







Image size: 520 x 274
View size: 1305 x 733
WL: 63 WW: 127



-  mm peak (Enoch et al. 2006)
-  sub-mm peak (Hatchell et al. 2005, Kirk et al. 2006)
-  ^{13}CO (Ridge et al. 2006)
-  mid-IR IRAC composite from c2d data (Foster, Laakso, Ridge, et al.)
-  Optical image (Barnard 1927)

2D image composite by Jonathan Foster, c 2006

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thirteenCO
thirteenCO
thirteenCO

127

64

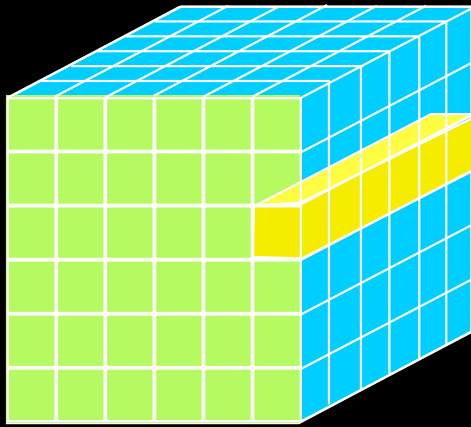
0

11:04

7.

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Im: 1/249
Zoom: 227% Angle: 0



DATA-DIMENSIONS-DISPLAY

1D: Columns = "Spectra", "SEDs" or "Time Series" (x-y Graphs)

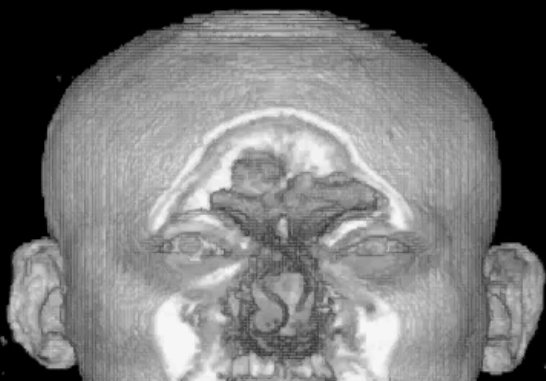
2D: Faces or Slices = "Images"

3D: Volumes = "3D Renderings", "2D Movies"

4D: Time Series of Volumes = "3D Movies"

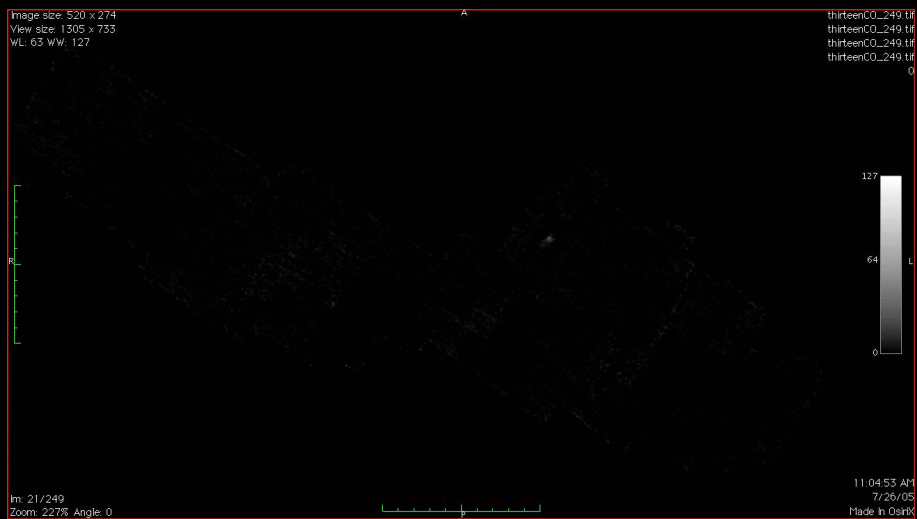
ASTRONOMICAL MEDICINE

"Keith"



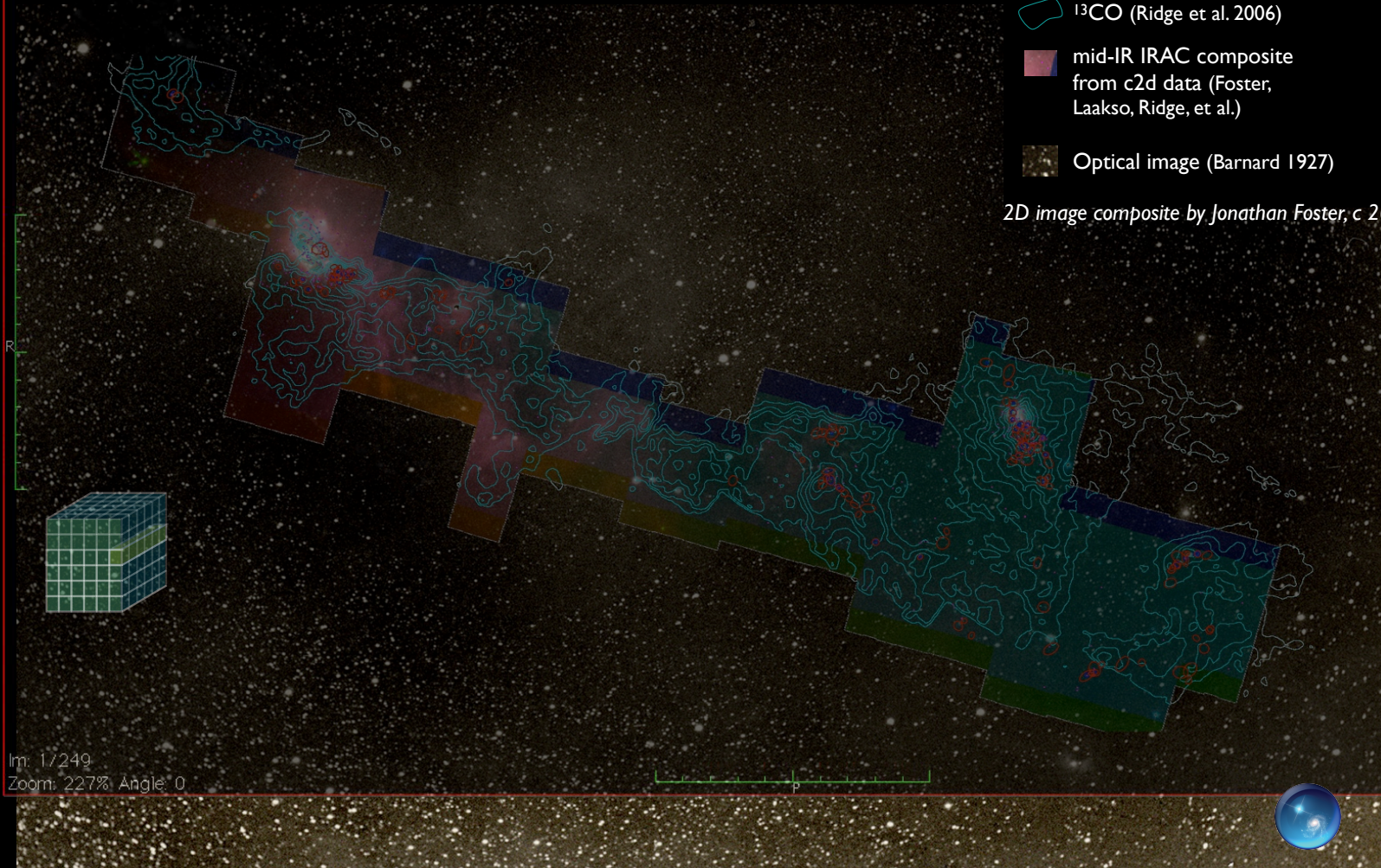
"z" is depth into head






"Perseus"



"z" is line-of-sight velocity

Image size: 520 x 274
View size: 1305 x 733
WL: 63 WW: 127



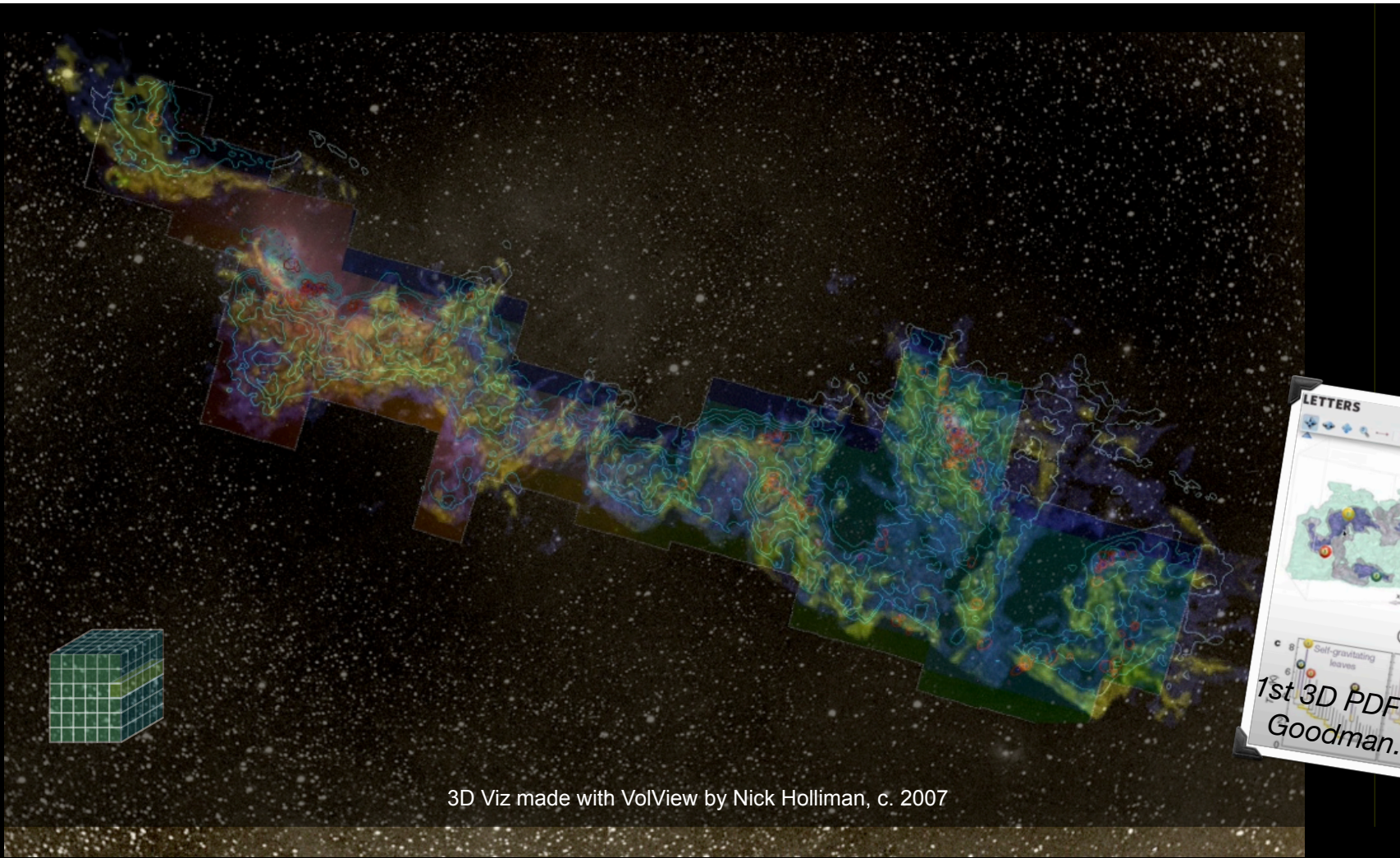
-  mm peak (Enoch et al. 2006)
-  sub-mm peak (Hatchell et al. 2005, Kirk et al. 2006)
-  ^{13}CO (Ridge et al. 2006)
-  mid-IR IRAC composite from c2d data (Foster, Laakso, Ridge, et al.)
-  Optical image (Barnard 1927)

2D image composite by Jonathan Foster, c 2006

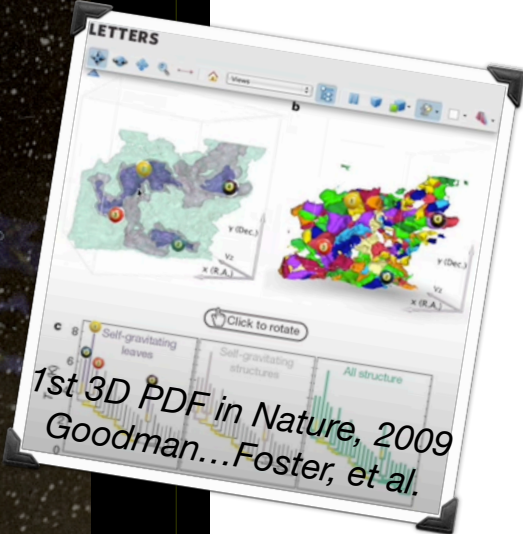
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thirteenCO_...
thirteenCO_...
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Im: 1/249
Zoom: 227% Angle: 0

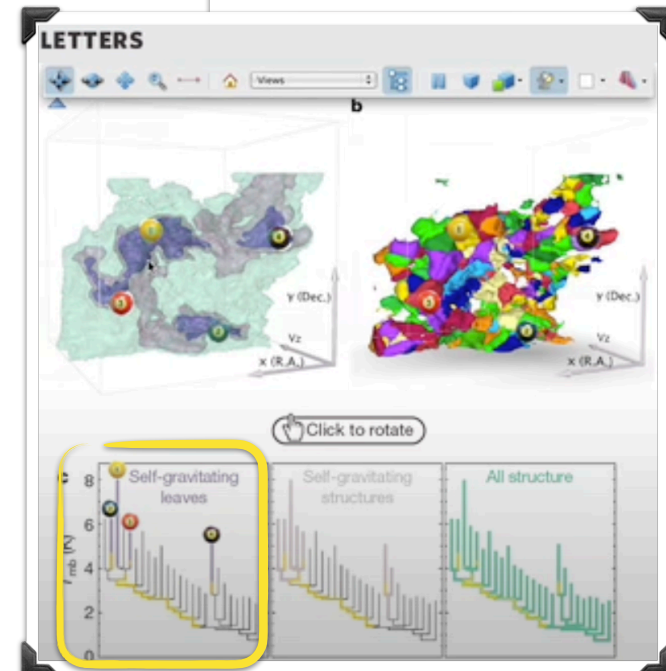
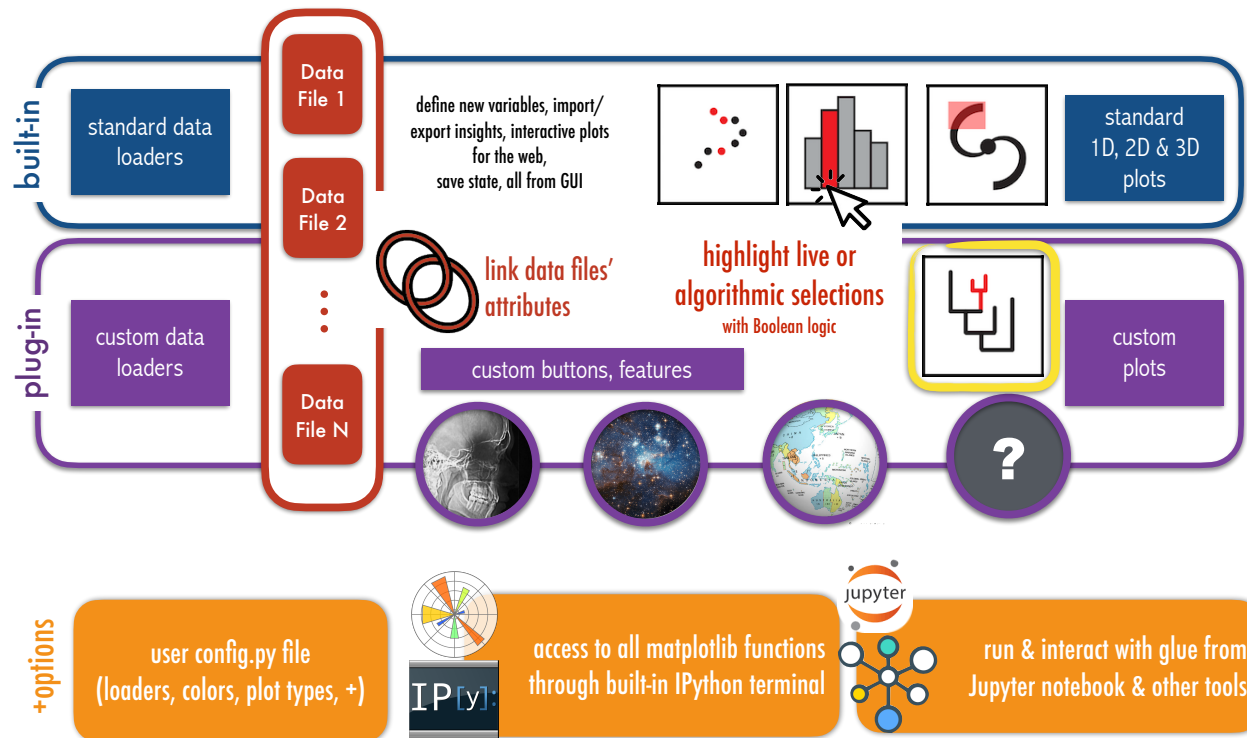


3D Viz made with VolView by Nick Holliman, c. 2007



1st 3D PDF in Nature, 2009
Goodman...Foster, et al.

COMPLETE

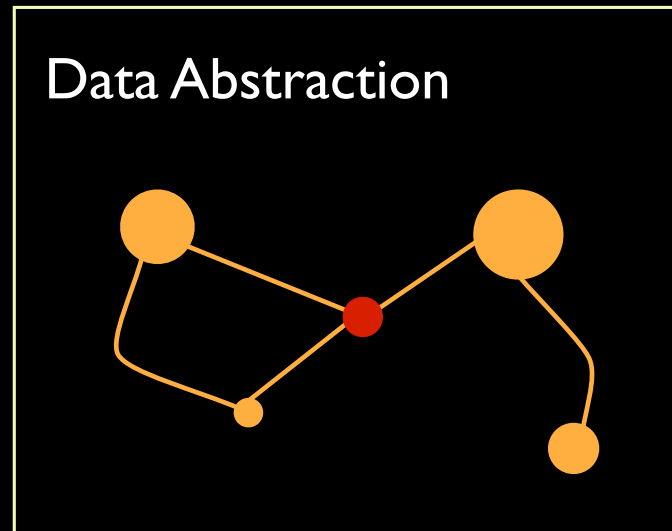
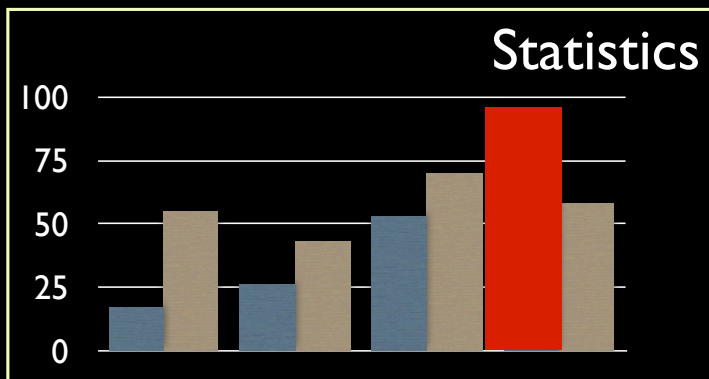
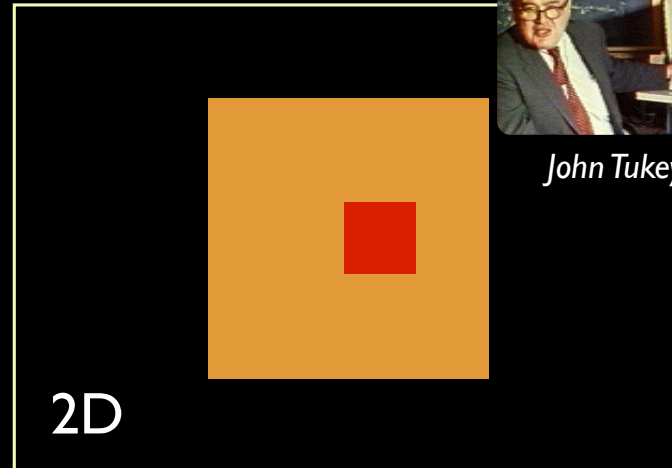
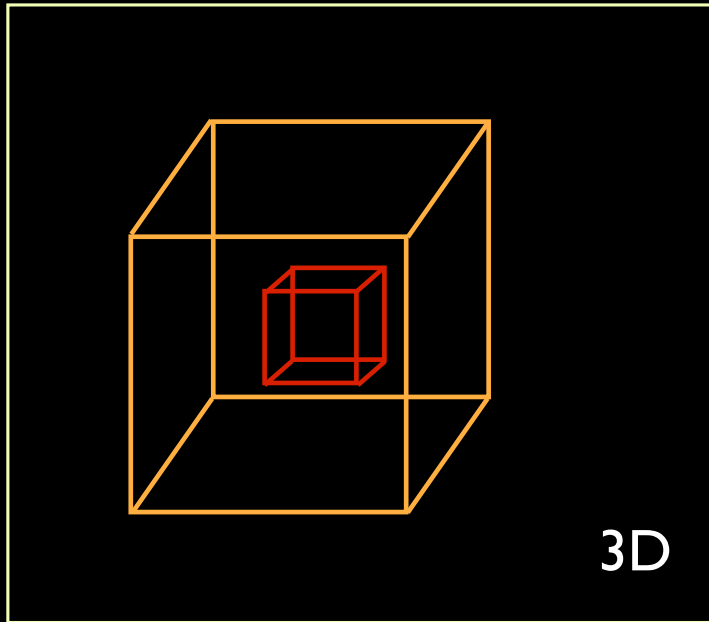


glueviz.org

LINKED VIEWS OF HIGH-DIMENSIONAL DATA



John Tukey



figure, by M. Borkin, reproduced from Goodman 2012, "Principles of High-Dimensional Data Visualization in Astronomy"

JOHN TUKEY'S LEGACY



PRIM-9

PRIM-H

DataDesk®

XGobi

GGobi

RGGobi



Microsoft
Power BI



Polaris



1970

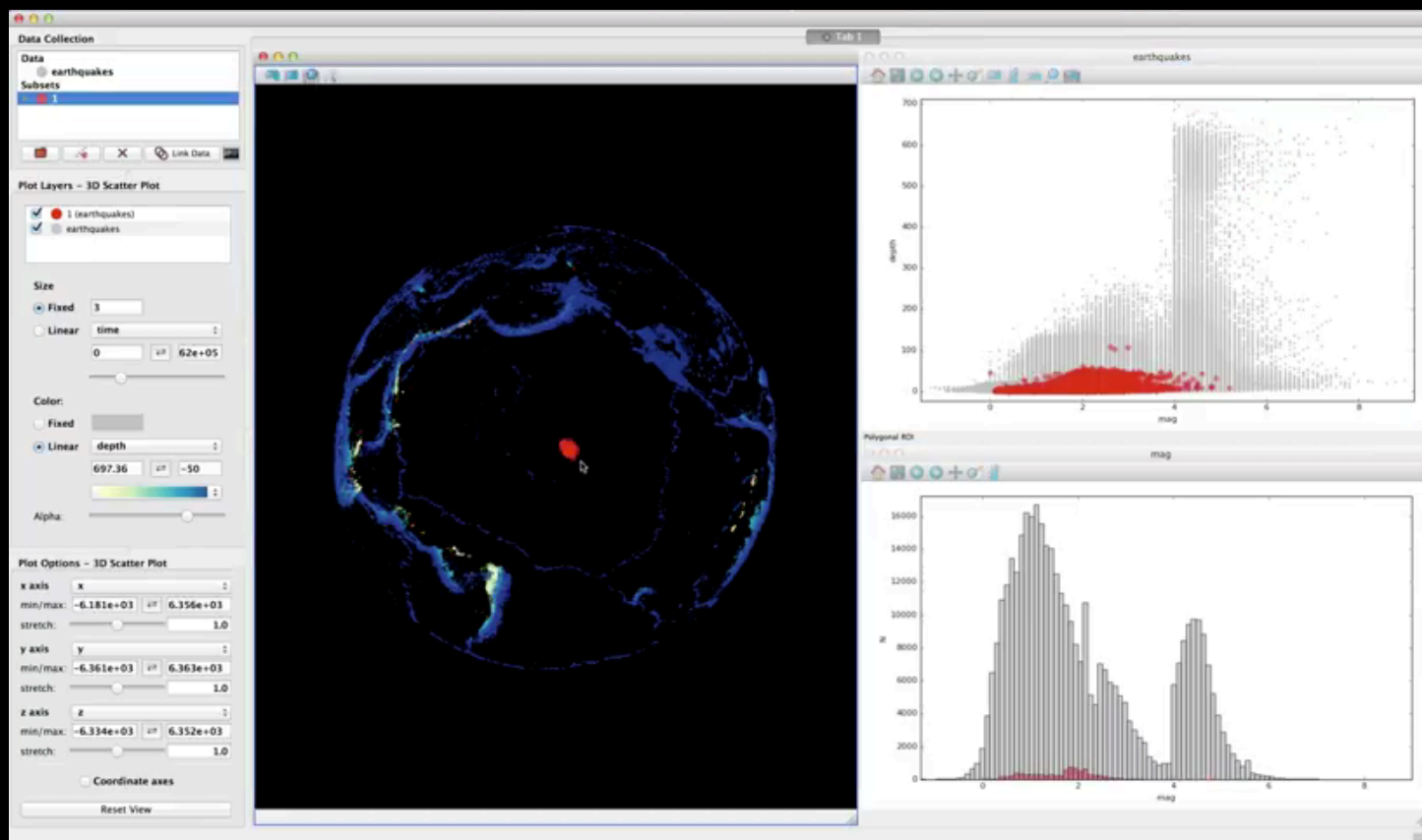
1980

1990

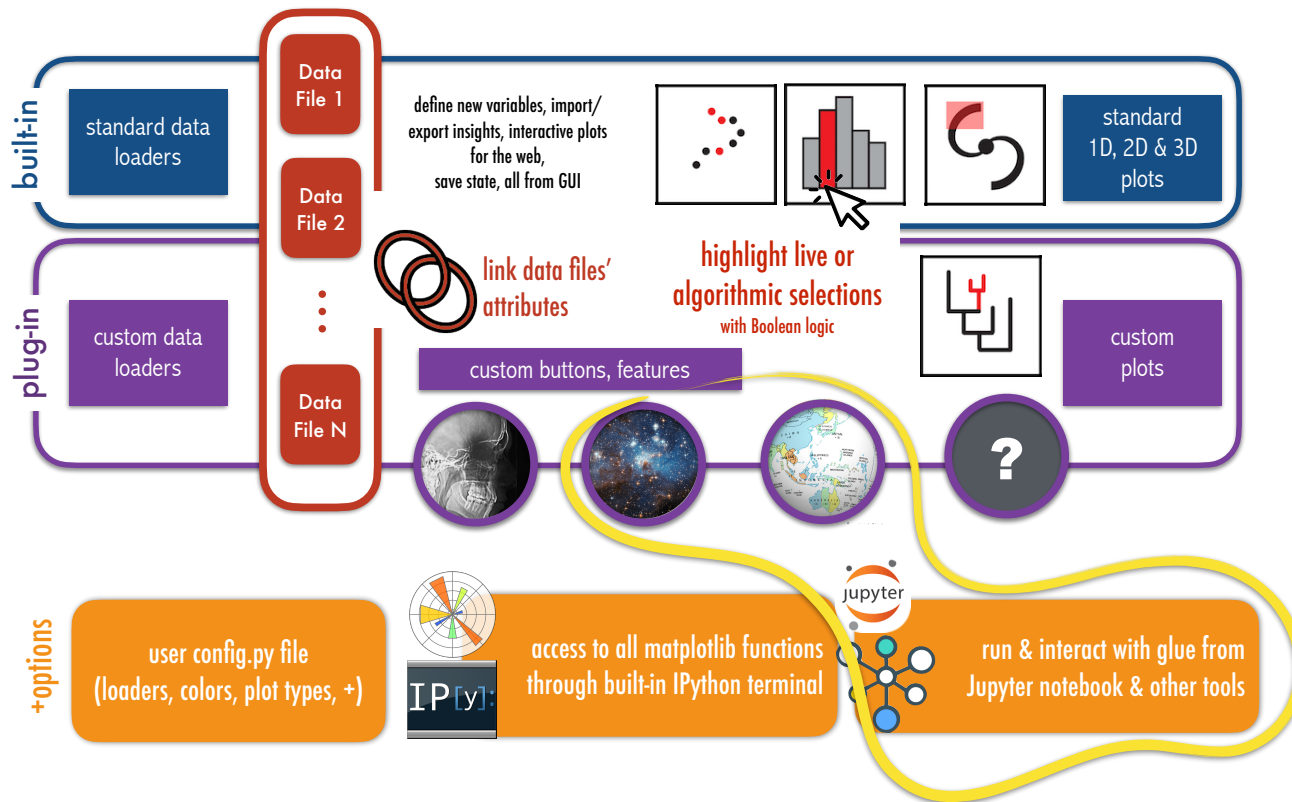
2000

2010

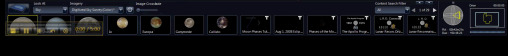
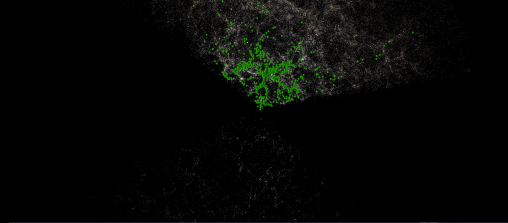
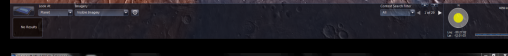
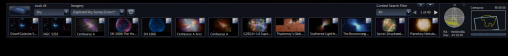
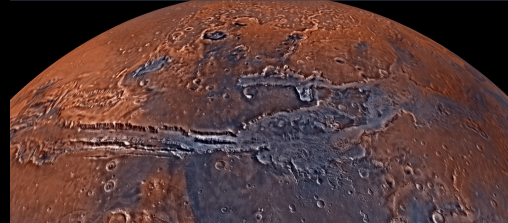
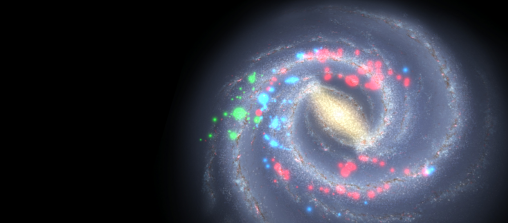
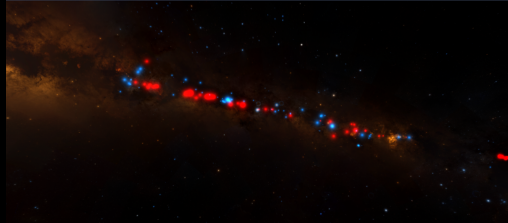
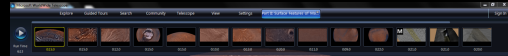
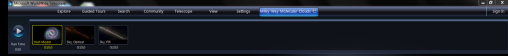
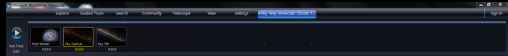
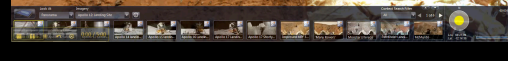
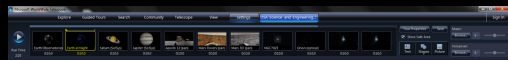
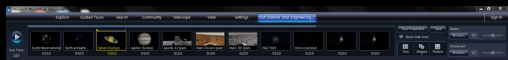
LINKED VIEWS OF HIGH-DIMENSIONAL DATA (IN PYTHON)



video by Tom Robitaille, lead glue developer
glue created by: C. Beaumont, M. Borkin, P. Qian, T. Robitaille, M. Breddels, and A. Goodman, PI



glueviz.org



worldwidetelescope.org

AAS WorldWide Telescope Explore Guided Tours Search Communities View Settings Support WWTelescope Sign Out

Collections > JWST > 1 of 4

Up Level NGC 1365 (MIRI I... NGC 7496 (MIRI I... NGC 1433 (MIRI I... Webb Uncovers ... A Spiral Amongst... Webb's View of t... Webb Inspects N... A Wreath of Star ... JWST Advanced ... Carina Nebula Je... Webb's View of t... Webb Finds Star... W191

Layers

- Sun
- Mercury
- Venus
- Earth
- Mars
- Jupiter
- Saturn
- Uranus
- Neptune
- Pluto
- Sky
- Overlays
 - Constellations
 - Constellation Pictures
 - Constellation Figures
 - Constellation Boundaries
 - Constellation Names
 - Grids
 - Equatorial Grid
 - Galactic Grid
 - AltAz Grid

Time Scrubber

Look At: Sky Imagery: Digitized Sky Survey (Color) Image Crossfade

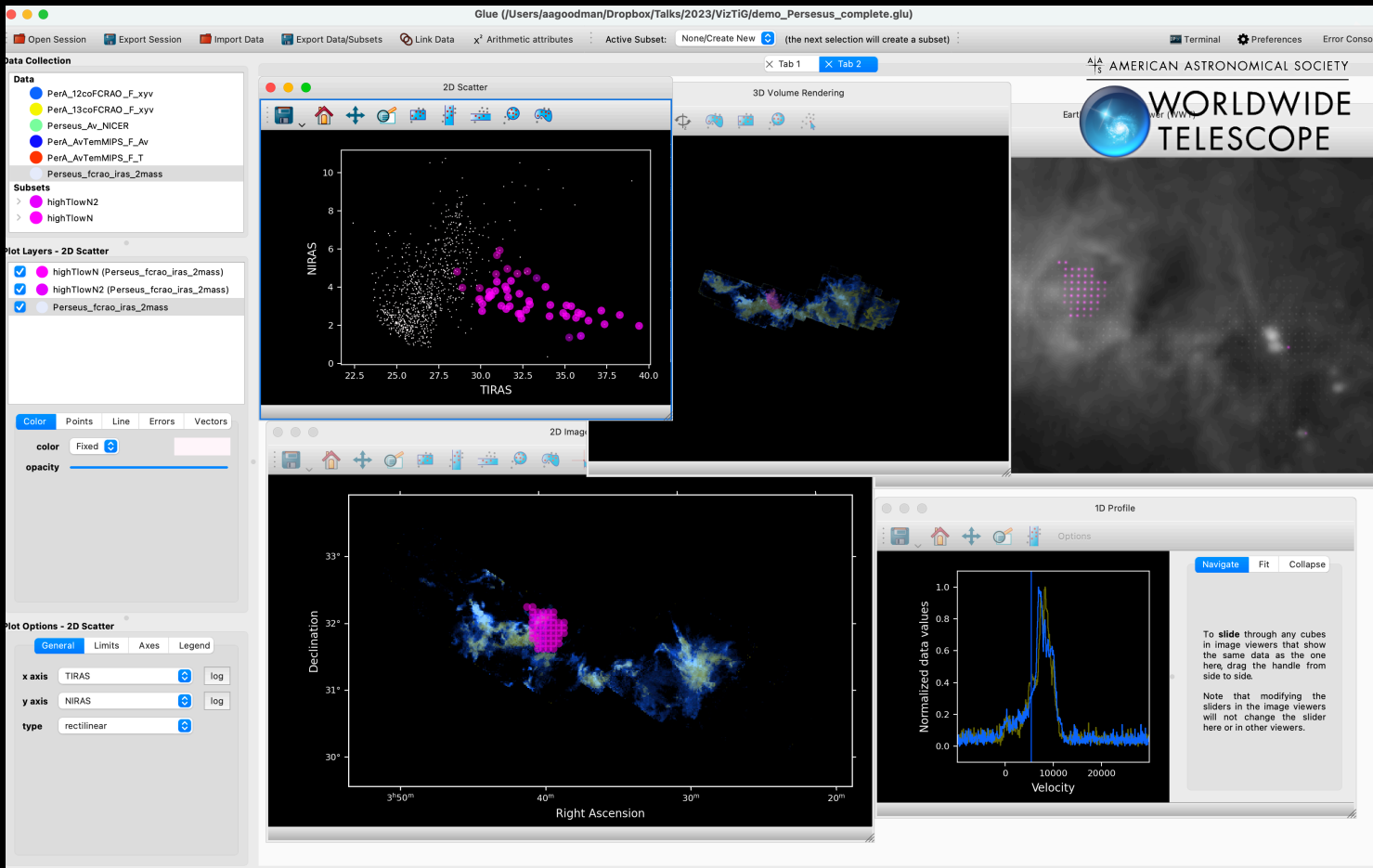
Tracking JWST Carina NIRCam 1 of 36

Moon JWST Carina MIRI JWST Carina NIR... Carina Nebula Je... Carina Nebula The star cluster N... NGC 3293 The Eta Carinae ... Carina Nebula Carina Nebula Panoramic view ... Carina Nebula

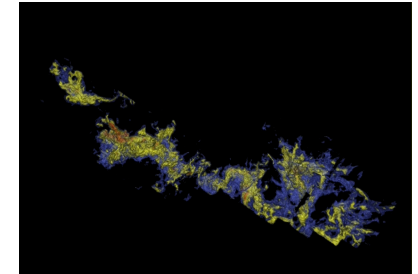
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worldwidetelescope.org



[demo; a 1-year data synthesis study in 5 minutes=Ridge et al. 2006]



THE ASTRONOMICAL JOURNAL, 643:932–944, 2006 June 1
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THE COMPLETE NATURE OF THE WARM DUST SHELL IN PERSEUS
 NAOMI A. RICE, SCOTT L. SCHIEFF, ALYSSA A. GOODMAN, AND JONATHAN B. FORTER
 Harvard-Smithsonian Center for Astrophysics, 60 Garden Street, Cambridge, MA 02138; nrice@jitch.harvard.edu,
 schieff@jitch.harvard.edu, agoodman@jitch.harvard.edu
 Received 2005 April 26; accepted 2006 January 19

ABSTRACT

The Perseus molecular cloud complex is a ≥ 30 pc long chain of molecular clouds most well known for the two star-forming clusters NGC 133 and IC 348 and the well-studied outflow source in B5. However, when studied at mid- to far-infrared wavelengths, the region is dominated by a ~ 10 pc diameter shell of warm dust, likely generated by an H II region caused by the early-B star HD 278942. Using a revised calibration technique the COMPLETE team has produced high-sensitivity temperature and column density maps of the Perseus region from IRAS Sky Survey Atlas (SSA) 60 and 100 μm data. In this paper, we combine the SSA-based dust-emission maps with other observations collected as part of the COMPLETE Survey, along with archival H α and MSX observations. Molecular line observations from FCRAO and extinction maps constructed by applying the NUCER method to the 2MASS catalog provide independent estimates of the “true” column density of the shell. Its emission in the region of the shell confirms that it is most likely an H II region located behind the cloud complex, and 8 μm data from MSX indicate that the shell may be intersecting with the cloud. Finally, the two polarization components seen toward background stars in the region by Goodman et al. can be explained by the association of the stronger component with the shell. If confirmed, this would be the first observation of a parsec-scale swept-up magnetic field.

Subject headings: dust, extinction — H II regions — infrared: ISM — ISM: individual (G159.6-18.5) — radio lines: ISM
 Online material: color figure

COLLABORATION



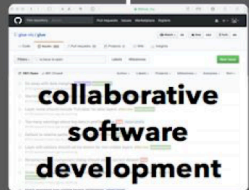
citizen science



shared data



**open source,
modular,
software**



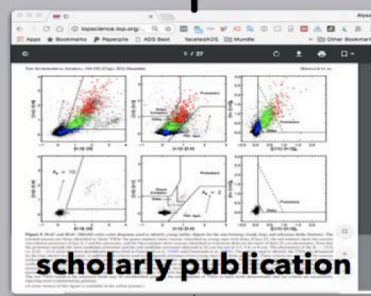
**collaborative
software
development**



EXPLANATORY VISUALIZATION



public outreach



scholarly publication

combined data sources

new findings

linked-view exploratory analysis of high-dimensional data

plug-in architecture

EXPLORATORY VISUALIZATION



New Thinking on, and with, Data Visualization

Alyssa A. Goodman, Harvard University
Michelle A. Borkin, Northeastern University
Thomas P. Robitaille, Aperio Software Ltd.

arxiv.org/abs/1805.11300

THE NEW YORK TIMES, TUESDAY, JANUARY 25, 2022

Where Our Bubble Ends, Our Understanding Begins

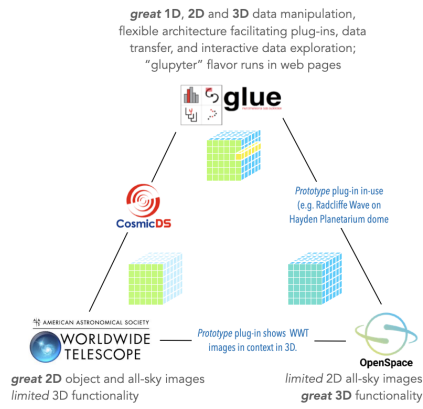
By mapping a region devoid of gas and dust, scientists learn more about star formation.

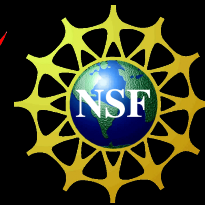
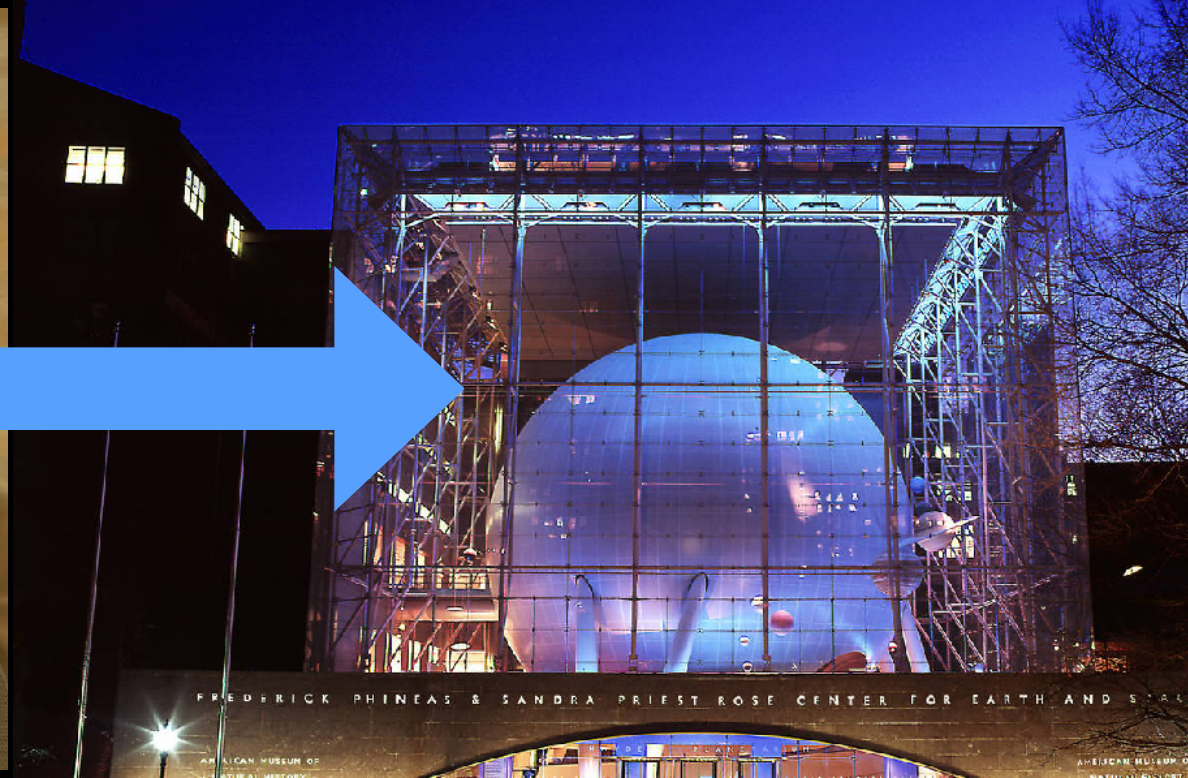
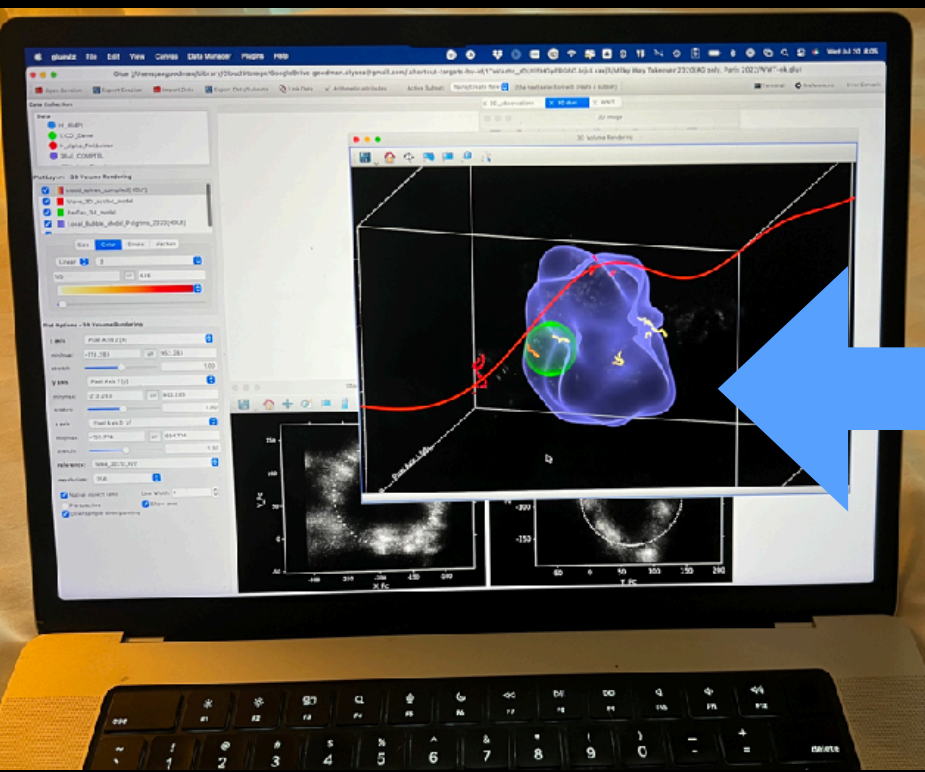
New York Times
January 25, 2022

THANKS FOR SHOWING ME THE UNIVERSE IN 2022! - ALYSSA

glue

multidimensional data exploration





A 3D visualization of the Milky Way galaxy, showing a central bulge and spiral arms. The visualization is rendered in a dark blue and purple color scheme with glowing points and lines. A prominent orange line curves across the scene, and a white line points towards the right. The text 'THE MILKY WAY IN 3D' is overlaid in a white, sans-serif font, with '(V1 - THE SUN'S NEIGHBORHOOD)' in a smaller font below it.

THE MILKY WAY IN 3D

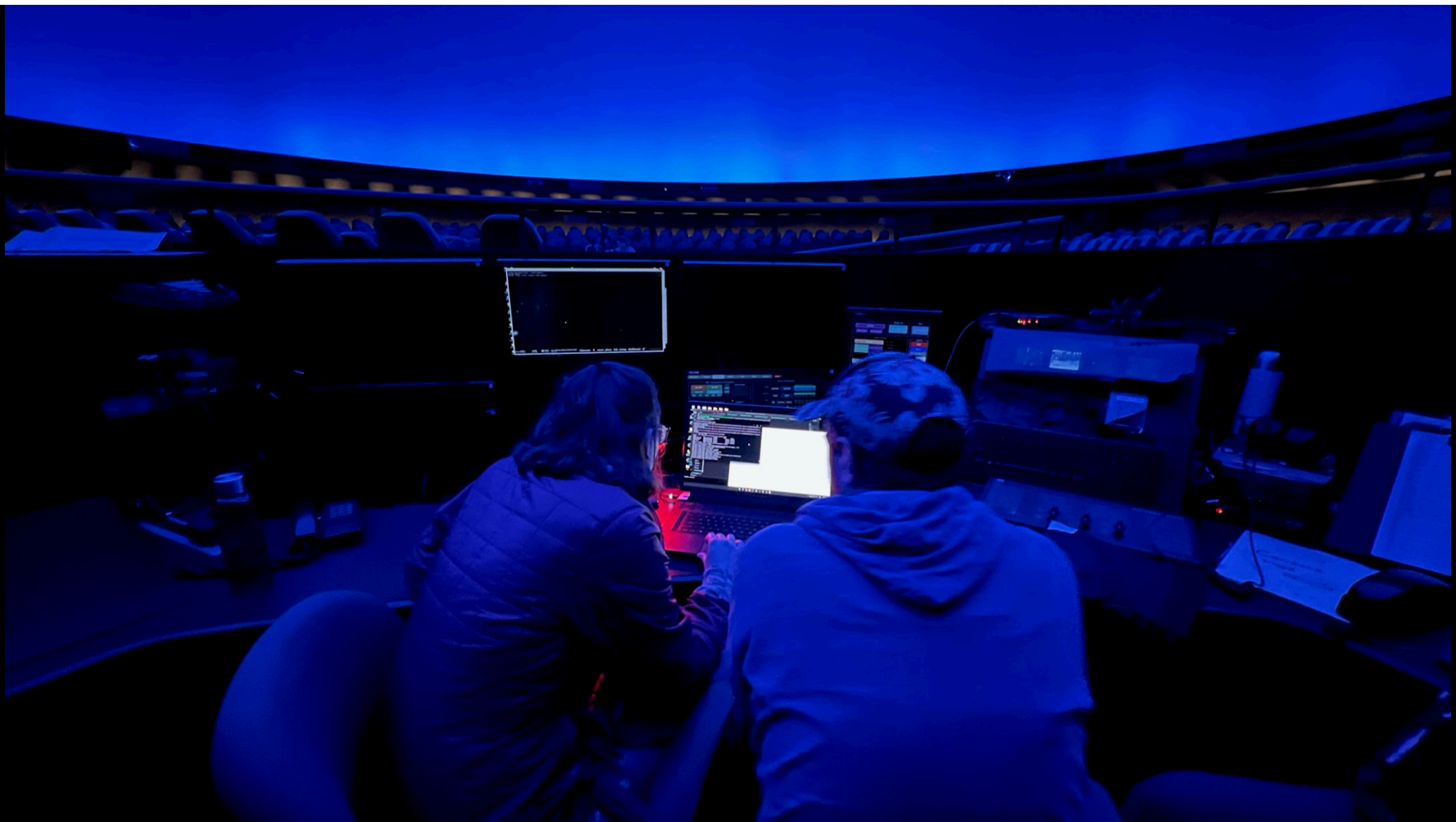
(V1 - THE SUN'S NEIGHBORHOOD)

Welcome to a new view of the Milky Way... in 3D!

Soon, milkyway3d.org will serve as a hub for the interconnected set of outreach, education, and research resources that will result from the interconnections we're in the process of making.

Our project includes new software development; approaches to data sharing; and scientific research questions propelling our collaboration forward.

milkyway3d.org

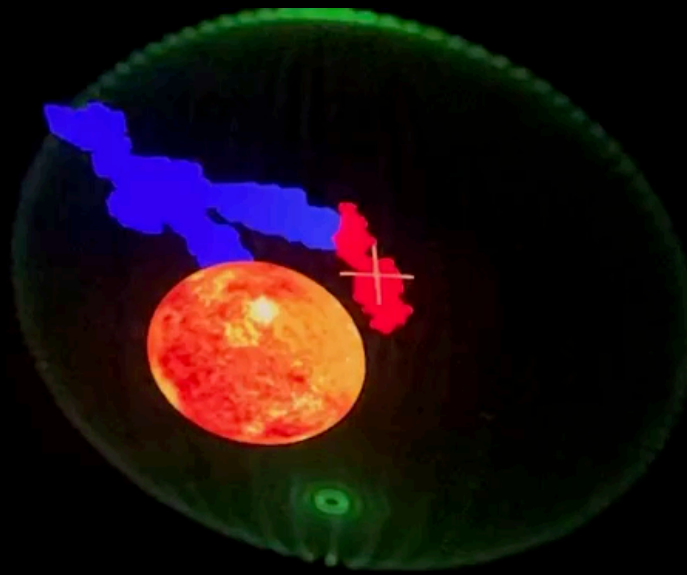


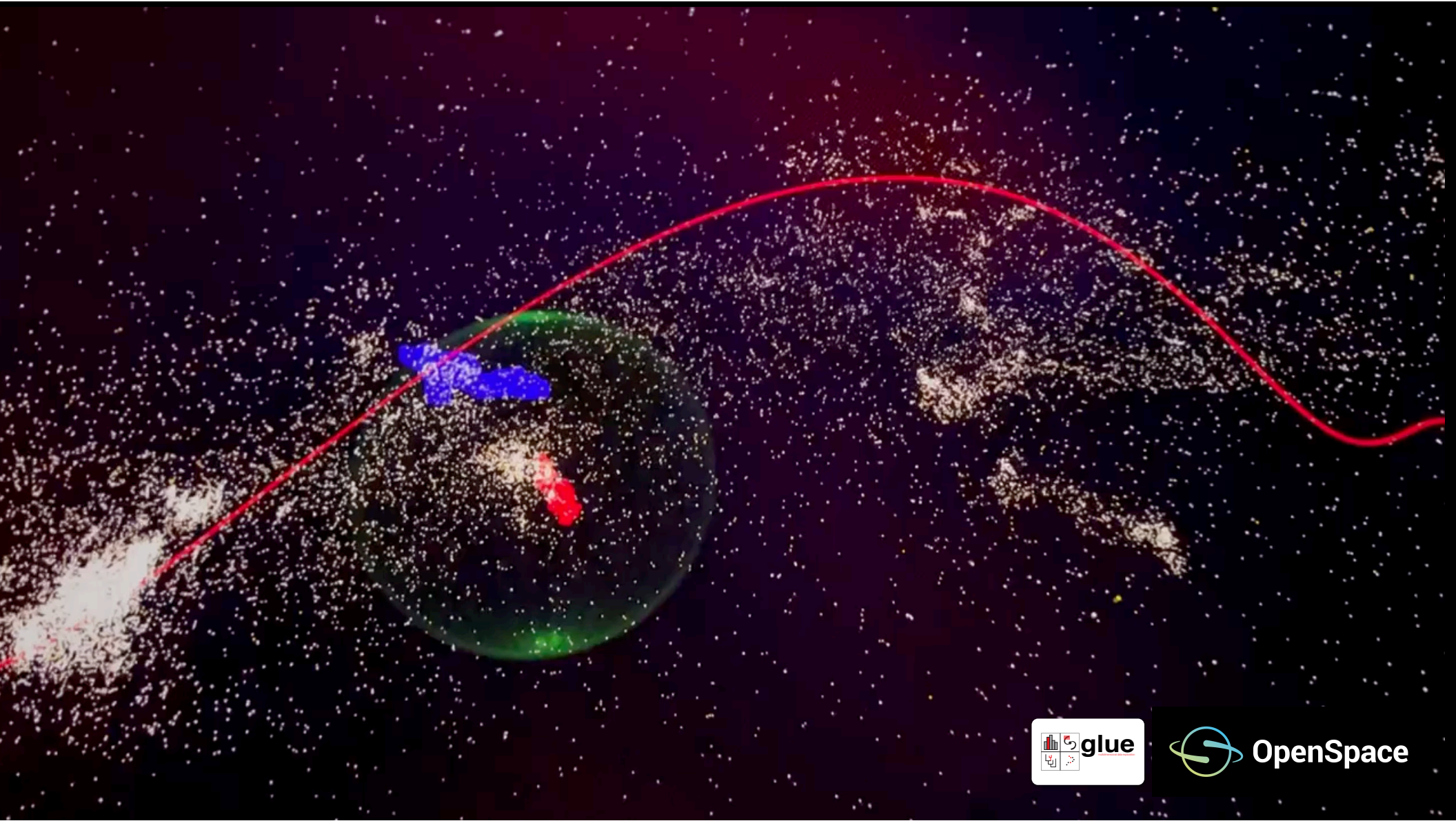


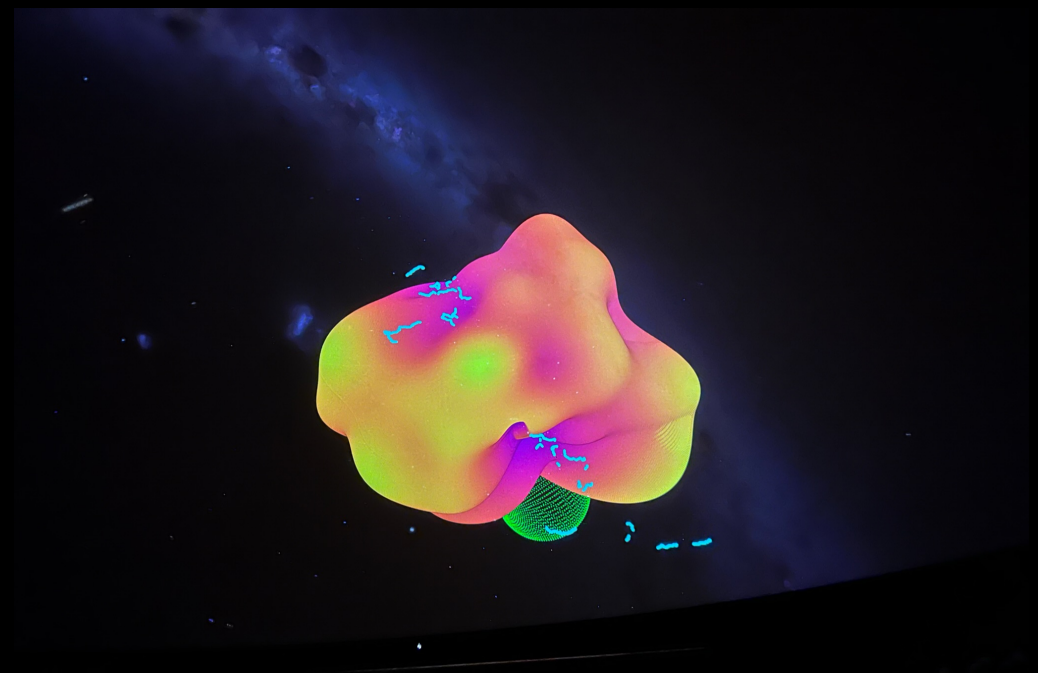
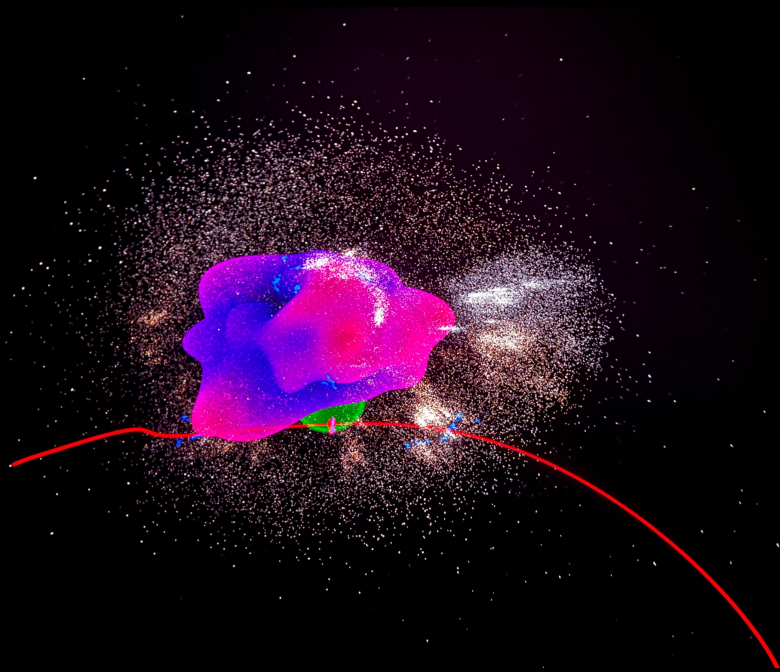
glue



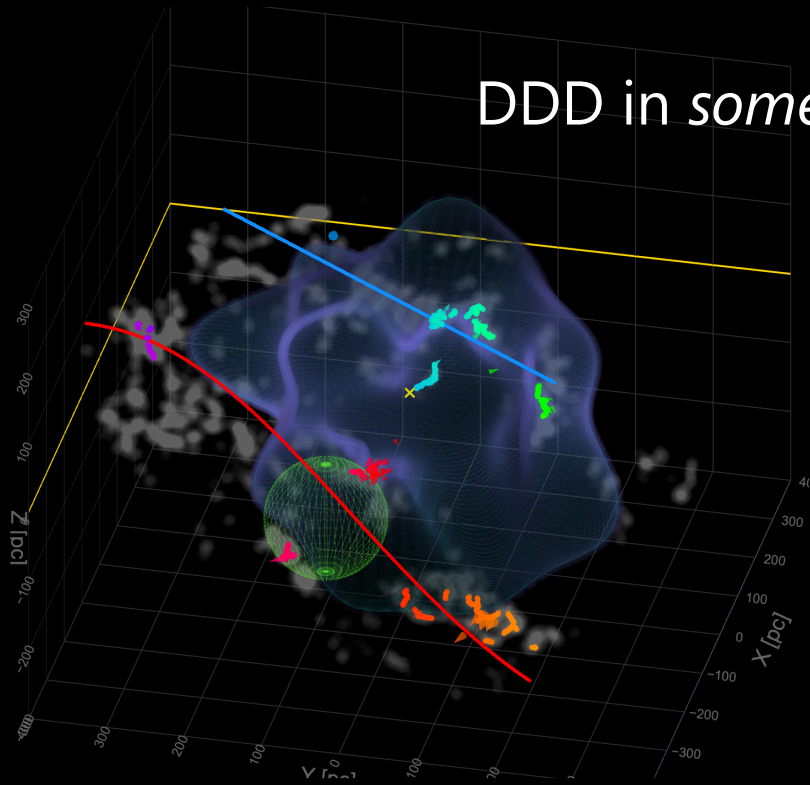
OpenSpace



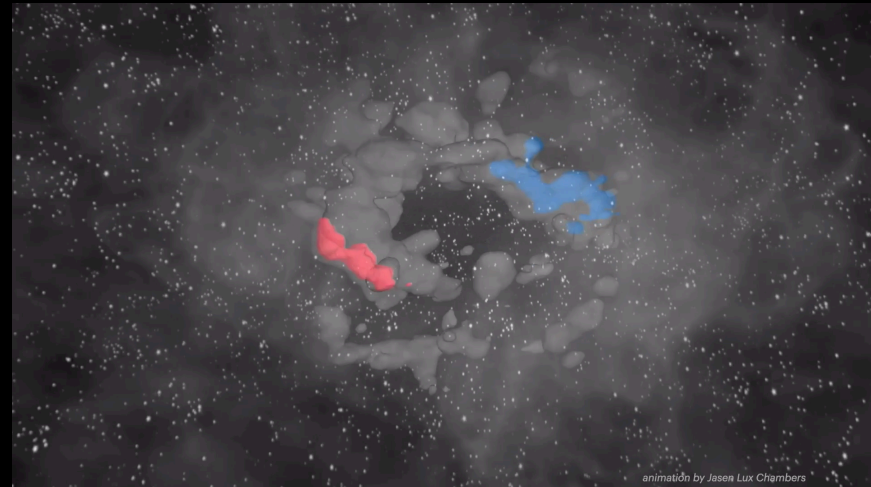




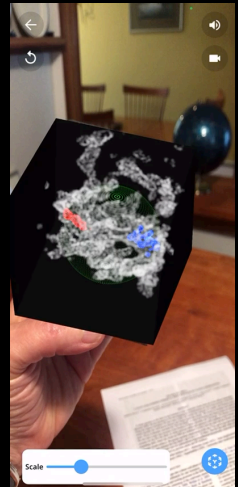
DDD in *some* of the Local ISM, recently



Zucker et al. 2022

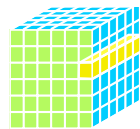


Bialy et al. 2021

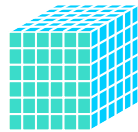
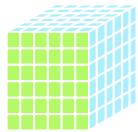


GOAL = DDD in *all* of the Local Milky Way *as we know it*

great 1D, 2D and 3D data manipulation,
flexible architecture facilitating plug-ins, data
transfer, and interactive data exploration;
“glupyter” flavor runs in web pages



Prototype plug-in in-use
(e.g. Radcliffe Wave on
Hayden Planetarium dome)



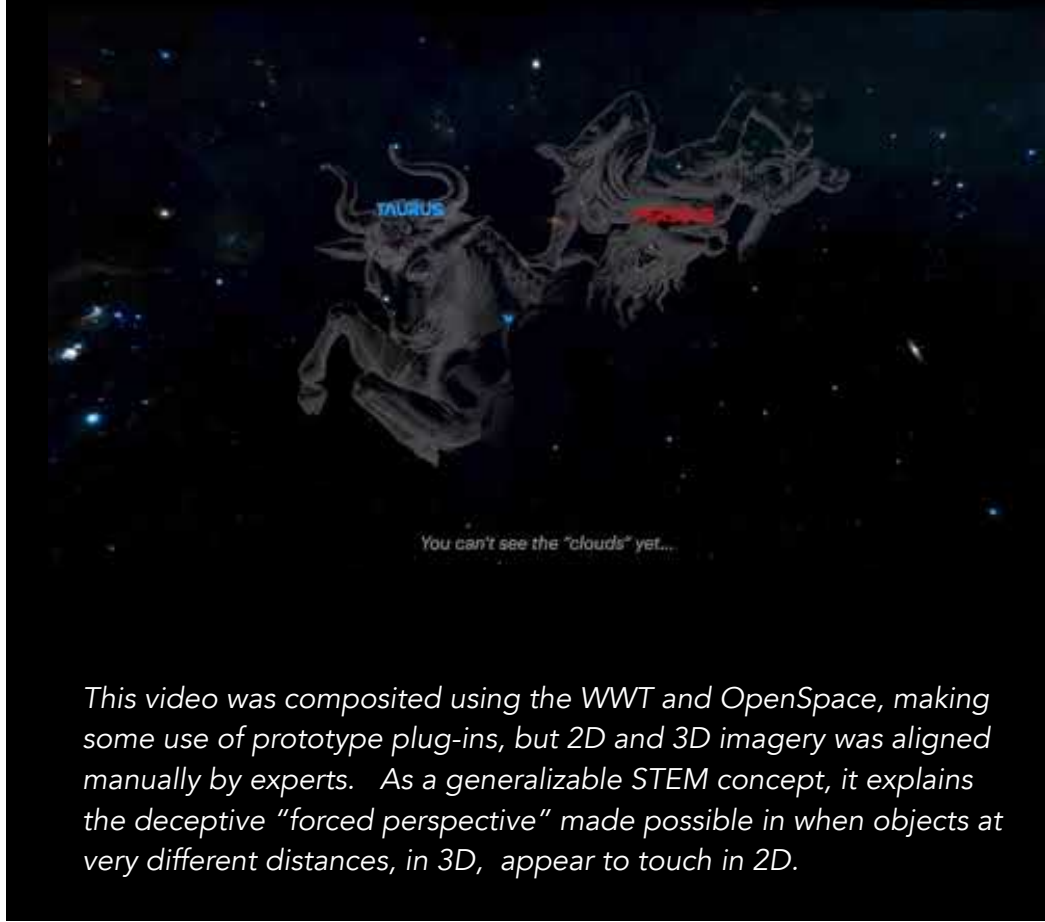
Prototype plug-in shows WWT
images in context in 3D.



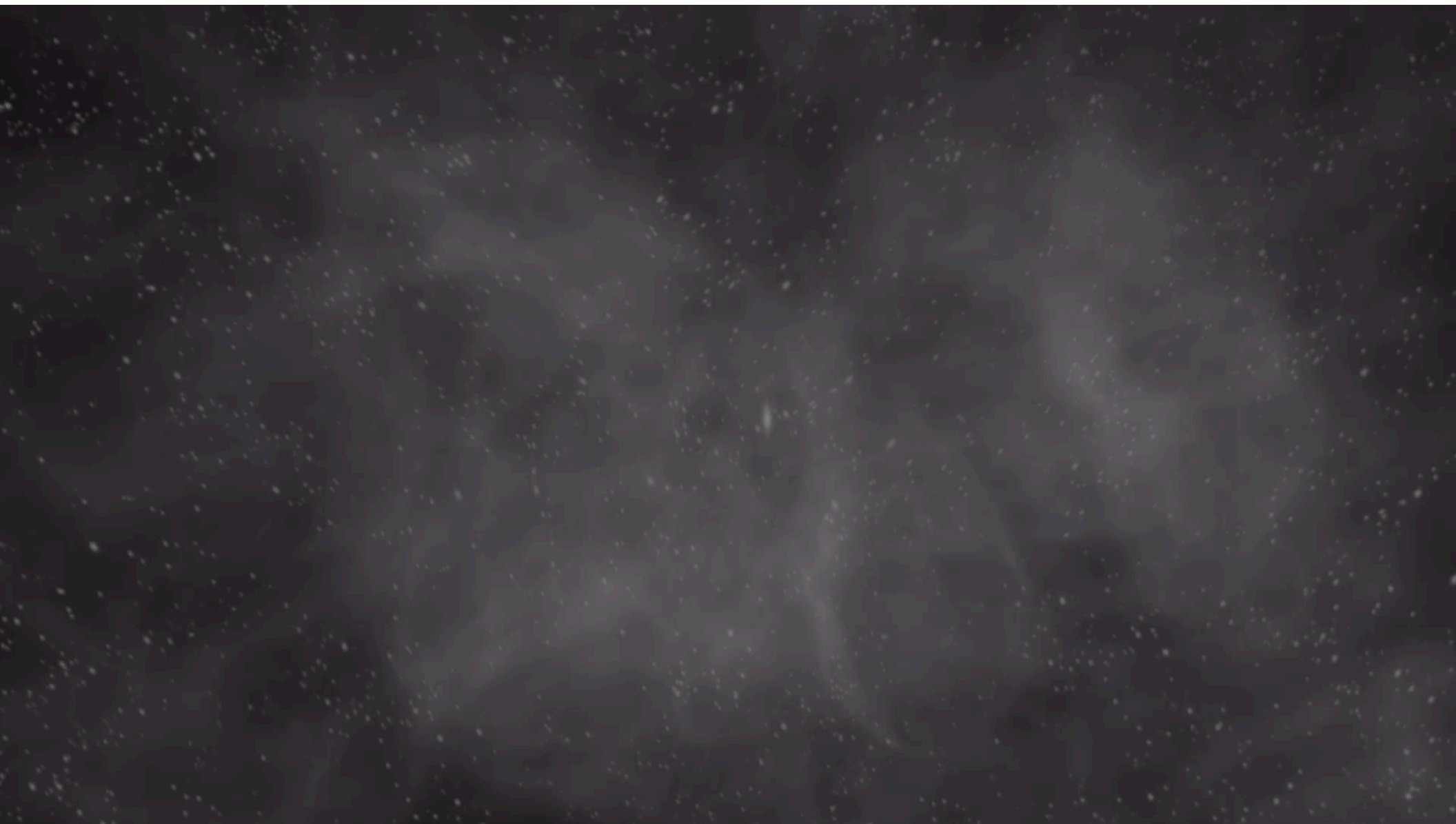
limited 2D all-sky images
great 3D functionality

great 2D object and all-sky images
limited 3D functionality

The “Perseus-Taurus Superbubble”
a demo of the need for 2D-3D contextualization functionality

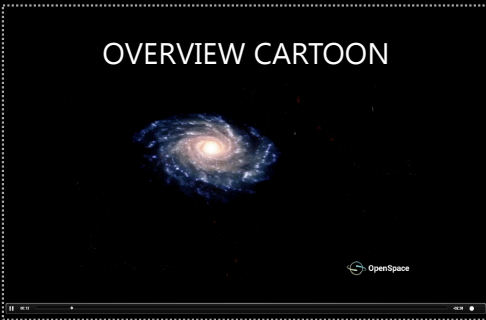


This video was composited using the WWT and OpenSpace, making some use of prototype plug-ins, but 2D and 3D imagery was aligned manually by experts. As a generalizable STEM concept, it explains the deceptive “forced perspective” made possible in when objects at very different distances, in 3D, appear to touch in 2D.

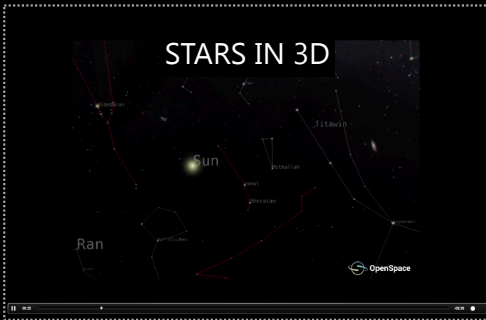


VISUALIZATION FEATURES

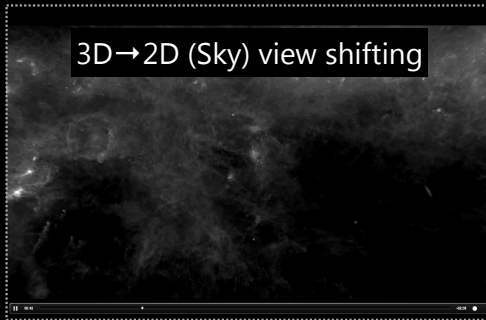
OVERVIEW CARTOON



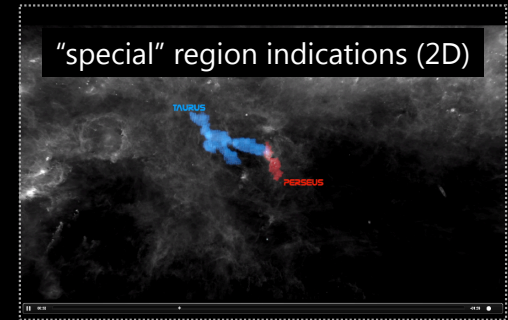
STARS IN 3D



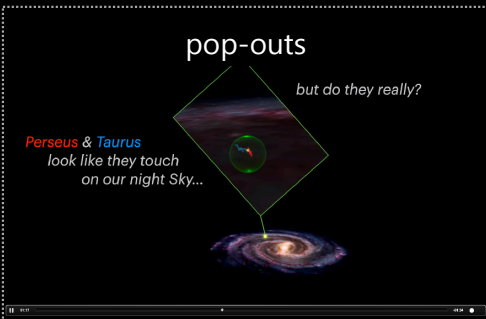
3D→2D (Sky) view shifting



"special" region indications (2D)



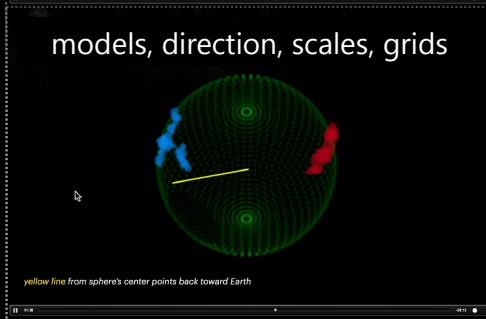
pop-outs



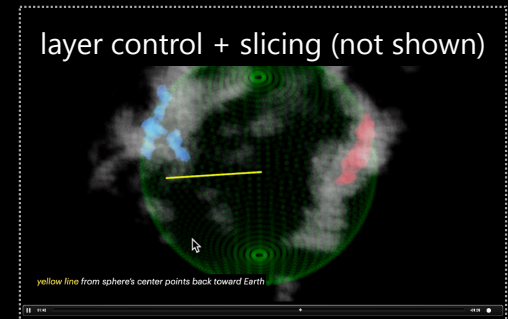
interaction, with user data added



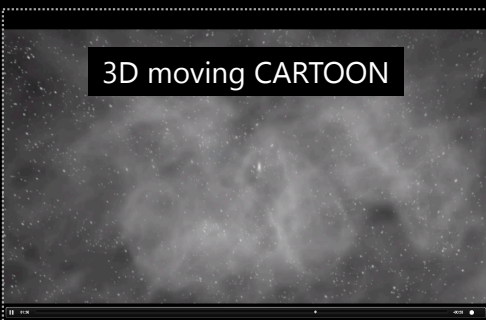
models, direction, scales, grids



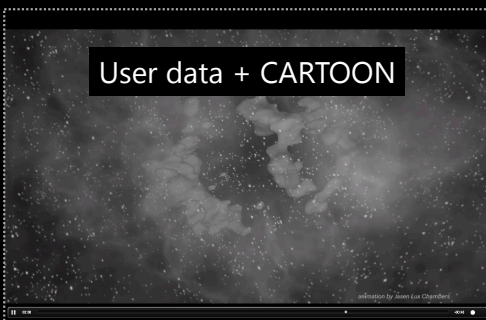
layer control + slicing (not shown)



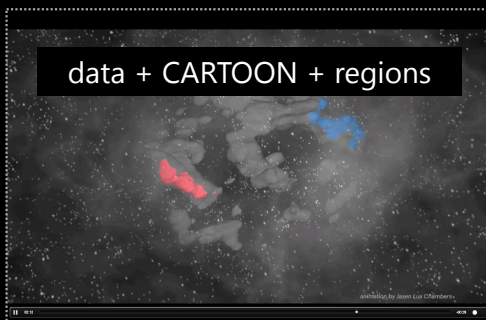
3D moving CARTOON



User data + CARTOON



data + CARTOON + regions



fully interactive attitude control



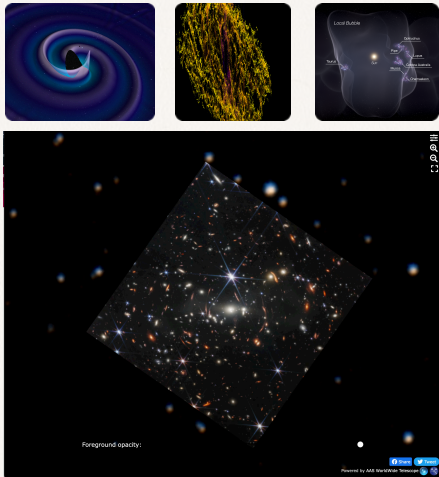
Opinion

The New Universe

MEMPHIS, SUNDAY OCTOBER 23, 2022

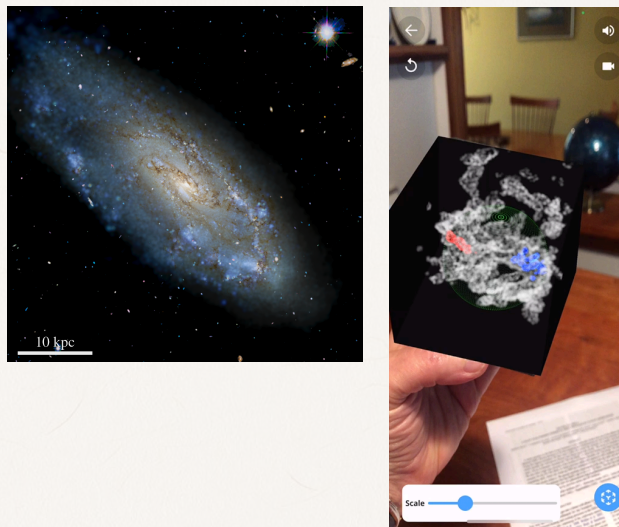
WHAT DO EXPENSIVE NEW TELESCOPES DO FOR HUMANITY TODAY?

Are mega-projects like ALMA, LIGO, JWST, and Gaia worth the billions?



ARE COMPUTERS THE NEW TELESCOPES?

New galaxies in-silico, the early Universe without physics, and new stars forming in your hand.

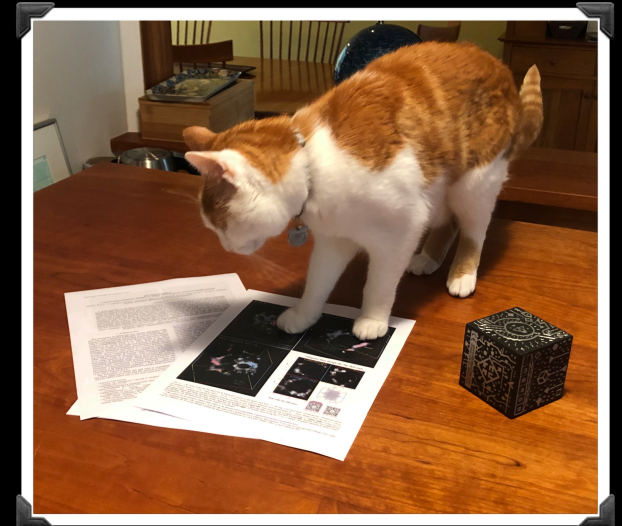
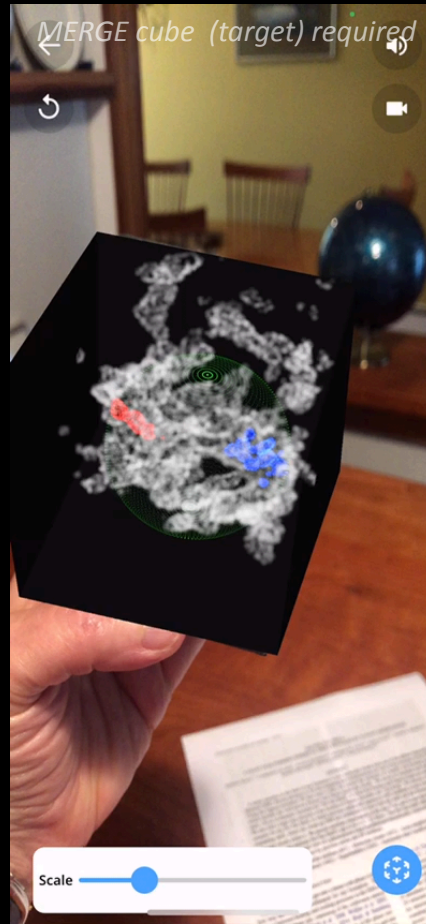
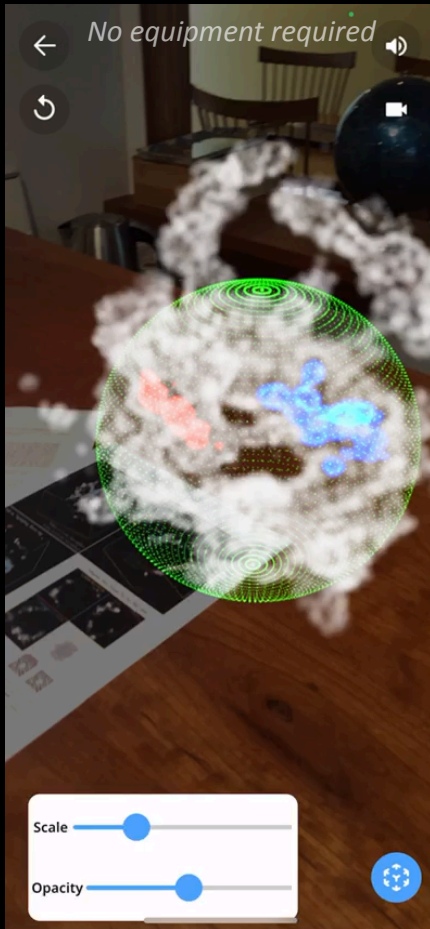


IS ASTROPHYSICS BEING (RE)ORGANIZED?

Lone stargazers are a rarer and rarer breed in professional astronomy. Teams and data scientists seem the way of the future, and tools that talk to each other are essential.



Editor: Alyssa Goodman, Center for Astrophysics | Harvard & Smithsonian, @AlyssaAGoodman



Augmented reality figures from Bialy et al. 2021.

Now funded to make "AR for all" by NSF



Exploring High-Dimensional Data in Astronomy, Genomics, and beyond, using glue



Coming in 2023, glue in jupyter lab v.0.1




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Filter files by name

Name	Last modified
3D Objects	7 months ago
anaconda3	3 months ago
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Contacts	7 months ago
Documents	7 months ago
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Links	7 months ago
Music	7 months ago
OneDrive	5 minutes ago
Python 3.10	6 months ago
Saved Games	7 months ago
scikit_learn_data	2 months ago
Searches	7 months ago
Videos	8 minutes ago
2016_Building_Energy_B...	7 days ago
bag_of_words.csv	2 months ago
data.csv	6 months ago
data34.csv	6 months ago
EdStatsData.csv	3 months ago
Espace.py	6 months ago
ExtractionWebUK.py	6 months ago
Fonctions.ipynb	a month ago
fropenfoodfacts.org.pro...	2 months ago
functions.py	a month ago
hello.txt	6 months ago
house.csv	2 months ago
my_courses.csv	2 months ago
my_course2.csv	2 months ago
mystery.csv	2 months ago
Nettoyage de Jeu.ipynb	3 months ago
P3_kNN_reconnaissance...	2 months ago
PackageCSVexo	6 months ago
personnes.csv	3 months ago
Projet 2.ipynb	3 months ago
Projet 2NC1.ipynb	2 months ago
Projet 3 Brouillon2.ipynb	a month ago


Launcher

Notebook



Python 3 (ipykernel)

Console



Python 3 (ipykernel)

Other

\$

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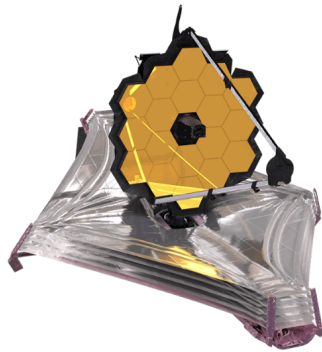
Terminal Text File Markdown File Python File Show Contextual Help

Glue Visualization



New Session

Cousins of



Quick insights for Images,
Spectra

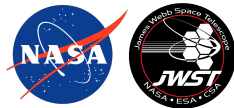
JDAViz

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MOSViz

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[Read more \(blog post at 10QViz.org\)...](#)

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[at Data+Climate site...](#)

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Data Science Education

Cosmic Data Stories

Sponsor: NASA, Science Activation
Program (funded proposal)

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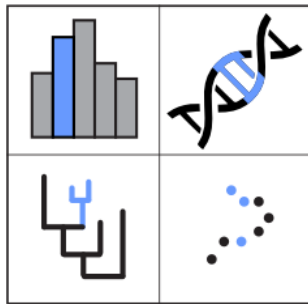
[GitHub](#)



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glupyter

Exploring High-Dimensional Data in Astronomy, Genomics, and beyond, using glue





glue genes

Exploring High-Dimensional Data in Astronomy, Genomics, and beyond, using glue

Alyssa Goodman

Robert Wheeler Willson Professor, Astronomy, Harvard University
& President, glue solutions, inc.

Jonathan Foster

Chief Technology Officer, glue solutions, inc.



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